## **Uncertainties Assessment in Nuclear Data Evaluations**

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Role & Importance of accurate nuclear data evaluations

Evaluations work in T-16

Statistical Analysis & Bayesian Inference Scheme.

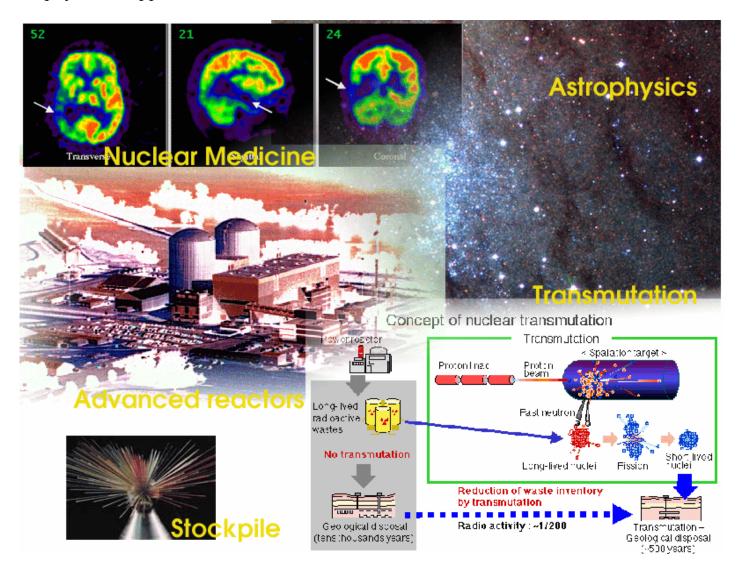
<sup>239</sup>Pu(n,f) & <sup>235</sup>U(n,f) cross-sections evaluations: The importance of raw data analysis and "clean-up"

Improvements?



## **Role & Importance of Nuclear Data Evaluations**

Accurate nuclear reaction cross sections are crucial in many areas of nuclear physics & applications.



#### T-16 work on nuclear data evaluations

- Nuclear reaction modeling: Hauser-Feshbach statistical theory of the compound nucleus, direct reactions, preequilibrium effects, intra-nuclear cascade, R-matrix analysis of reactions on light-elements,...
  - Many physics "ingredients" enter in such modeling: nuclear masses, fission barriers, nuclear level densities, ...
  - Creation of **ENDF** files (Evaluated Nuclear Data File): electronic files containing valuable informations on reaction cross-sections, energy-angle spectrum of emitted particles, recoil heavy nuclei, etc.
    - These evaluations are the result of a combination of theoretical modeling and experimental data analysis.
  - **Bayesian inference scheme** to get "best estimates" from experimental data (underlying goal: reducing the role of systematic errors in experimental setups).

## A Practical Evaluation...

...usually involves **experimental data combined with theoretical modeling**. In some cases however, the evaluation has to rely on experimental data sets only (no available model reliable enough).

# Statistical Analysis of Experimental Data Sets

- Mathematical tools: Bayesian inference scheme or/and simultaneous evaluation;
- Careful examination of experimental data sets; What is measured is rarely equivalent to what one seeks to obtain! The relationship between what is measured and what is sought must be specified in order to carry out a proper evaluation.
  - **\*** Good information on experimental conditions is crucial!

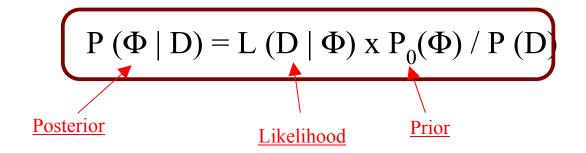
# Statistical Data Evaluation (1)

- 1. Bayes' Theorem
- 2. Maximum likelihood condition
- 3. Generalized Least-Squares Method

**D**: a data set

 $\Phi$ : a set of physical quantities (or parameters) to be determined

Bayes' theorem:



- The prior gathers information available before acquiring the new data set D;
  The likelihood function gives the probability of observing D if the parameters  $\Phi$  were indeed true.
- **Iterative** approach.

# Statistical Data Evaluation (2)

#### **Maximum likelihood condition**

<u>Likelihood</u>:

$$L(\mathbf{D},\mathbf{p}) \propto \exp \left\{ (-1/2) [\mathbf{y} - \mathbf{f}(\mathbf{p})]^{+} V_{\mathbf{y}}^{-1} [\mathbf{y} - \mathbf{f}(\mathbf{p})] \right\}$$

Where  $V_{v}$  represents the experimental covariance matrix,

**p** is the parameters vector, and  $\mathbf{f}(\mathbf{p})$  correspond to the experimental values  $\{\mathbf{y}\} \equiv \mathbf{D}$ .

- Let us suppose that the prior includes an initial parameter set  $\mathbf{p}_0$  (and corresponding covariance matrix  $\mathbf{V}_0$ ), then the PME brings a multivariate normal distribution,
  - Prior:  $P_0(\mathbf{p}) \propto \exp \left\{ (-1/2) \left[ \mathbf{p} \mathbf{p_0} \right]^+ \mathbf{V_0}^{-1} \left[ \mathbf{p} \mathbf{p_0} \right] \right\}$

# Statistical Data Evaluation (3)

The **Generalized Least- Squares Method** is based on the Bayes' theorem plus a maximum-likelihood condition.

$$[y-f(p)]^+V_y^{-1}[y-f(p)]+[p-p_0]^+V_0^{-1}[p-p_0] = min$$

Note that prior and new information need to be independent!

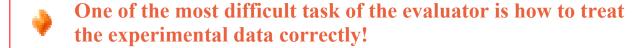
## → Solution:

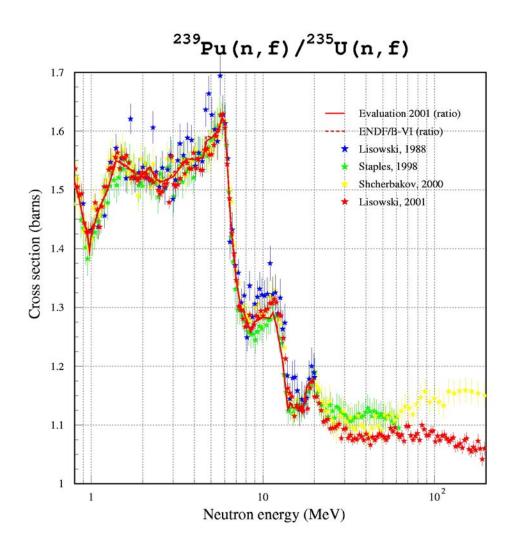
$$\begin{array}{c} \mathbf{p} = \mathbf{p}_0 + \mathbf{V}_0 \ \mathbf{C}^+ (\mathbf{Q} + \mathbf{V}_y)^{-1} [\mathbf{y} - \mathbf{f}(\mathbf{p}_0)], \\ \mathbf{Q} = \mathbf{C} \mathbf{V}_0 \mathbf{C}^+, \\ \mathbf{V}_p = \mathbf{V}_0 - \mathbf{V}_0 \mathbf{C}^+ (\mathbf{Q} + \mathbf{V}_y)^{-1} \mathbf{C} \mathbf{V}_0, \\ (\chi^2)_{\min} = [\mathbf{y} - \mathbf{f}(\mathbf{p}_0)]^+ (\mathbf{Q} + \mathbf{V}_y)^{-1} [\mathbf{y} - \mathbf{f}(\mathbf{p}_0)]. \end{array}$$

Assuming that the model is *linear*, i.e., f(p)=Cp.

# An example: <sup>239</sup>Pu (n,f) and <sup>235</sup>U (n,f) cross sections below 20 MeV.

- <sup>239</sup>Pu is a very important isotope in the US nuclear stockpile; <sup>235</sup>U is a corner stone in almost every nuclear data evaluations (" standard").
- \* <sup>239</sup>Pu (n,f) experimental database used:
  - $\sim$  50 sets ( $\sim$  1000 energy points);
  - absolute and in ratio to  $^{235}U(n,f)$ ;
  - includes very recent data sets (e.g., Lisowski 2001, LANSCE);
  - revisits older data sets.
- ★ <sup>235</sup>U (n,f) experimental database:
  - Absolute measurements;
  - Shape measurements (no flux normalization for instance);
  - In ratio to light elements reactions.

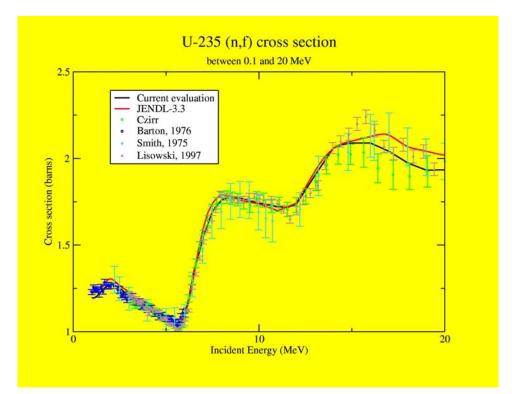


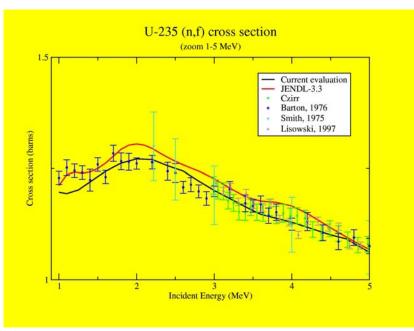


Fairly precise ratio evaluation below 20 MeV;

**Resulting point- wise errors reduced from last evaluation (caution!)**;

Few (discrepant) experimental data sets beyond 20 MeV.





Point- wise uncertainties less than  $\sim$ 1% for both JENDL- 3.3 and the current evaluation; BUT, these two evaluations differ by more than 3% in places!

The discrepancies come from *ad-hoc* correction of experimental data sets alone (the different mathematical tools give quite similar answers).

## **Improvements?**

New tools: Sensitivity analysis;

Robust inference (e.g., to deal with outliers);

Markov chain Monte-Carlo simulations.

## What's next?

New studies of neutron-induced fission cross sections of actinides present in the nuclear waste stream (e.g.,

<sup>237</sup>Np, <sup>241</sup>Am).

"I play at écarté with a gentleman whom I know to be perfectly honest. What is the chance that he turns up the king? It is 1/8. This is a problem of the **probability of effects**. I play with a gentleman whom I do not know. He has dealt ten times, and he has turned the king up six times. What is the chance that he is a sharper? This is a problem of the **probability of causes**. It may be said that it is **the essential problem of the experimental method**."

- Henri Poincaré, "Science & Hypothe